

# Air Quality Forecasting Tools

## OVERVIEW

- Background
- Acquiring historical data
- Forecasting tools (examples, strengths/weaknesses)
  - Climatology
  - Statistical
  - Modeling

Details on developing forecasting methods are provided in the Ozone and PM<sub>2.5</sub> Forecasting Guidance Document (U.S. Environmental Protection Agency, 2003).

# Background

- Forecasters use a variety of data products, information, tools, and experience to predict air quality.
- Forecasting tools:
  - Subjective
  - Objective
- Tools provide information to help guide the forecasting process.
- Forecasting tools are built upon an understanding of the processes that control air quality.
- More forecasting tools = better results.


# Background

Tool development is a function of:

- Amount and quality of data (AQ and meteorological)
- Resources for development (human, software, computing)
- Resources for operations (human, software, computing)

Types of tools:

- Persistence
- Climatology\*
- Criteria, Thresholds, Rules of thumb
- Regression equations\*
- Classification and Regression Trees (CART)\*
- Neural networks
- Fuzzy logic
- Numerical modeling\*
- Conceptual and experience



Fewer resources,  
lower accuracy

More resources,  
potential for higher  
accuracy

\*Discussed in this course

# Acquiring Historical Data (1 of 2)

## Sources

- Air Quality Data
  - EPA's AIRS database
  - AIRNow (regional images)
- Meteorological Data
  - See Appendix for list of data sources
  - Soundings and surface observations
  - Data and weather maps
  - Trajectories
  - Satellite images

# Acquiring Historical Data (2 of 2)

## Sample size

- Acquire 3 to 5 years of data
- Be aware of changes in emissions (fuel changes, new sources, new monitors)

## Other issues

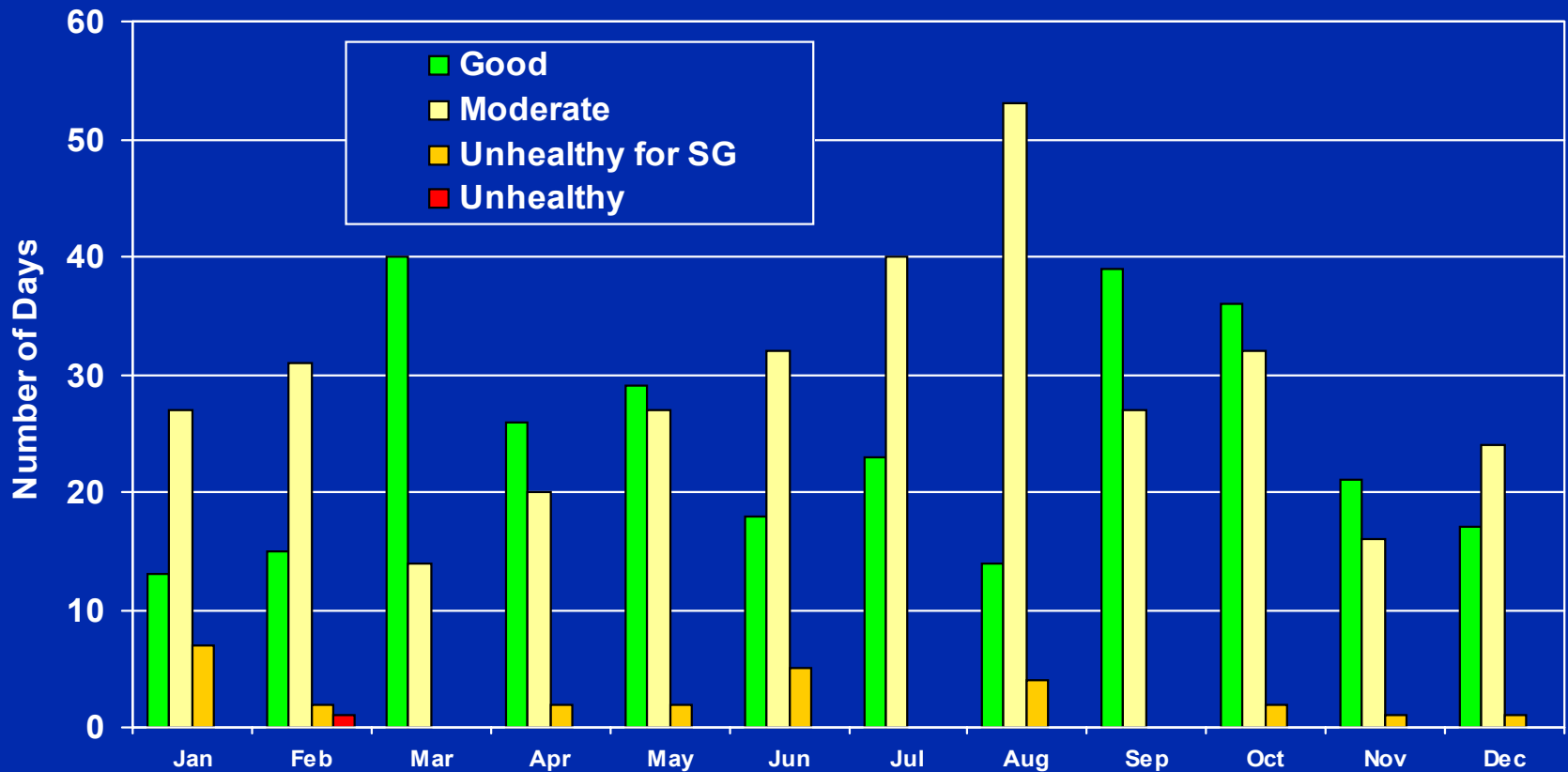
- Time standard and units
  - Air quality data are usually in Local Standard Time
  - Meteorological data are usually in UTC
  - Concentrations in  $\mu\text{g}/\text{m}^3$ , ppm, ppb
- Data quality
  - Review data for quality prior to use
- Data completeness
  - 75% of data are needed to compute daily, monthly, and annual averages

# Climatology

- Study of average and extreme weather (or air quality) conditions
- Examines past conditions for
  - Maximum and minimum values
  - Duration of poor air quality days
  - Average number of days in each AQI category
  - Diurnal patterns
  - Day-of-week distributions
  - Weekend/weekday distributions
- Helps guide forecasters

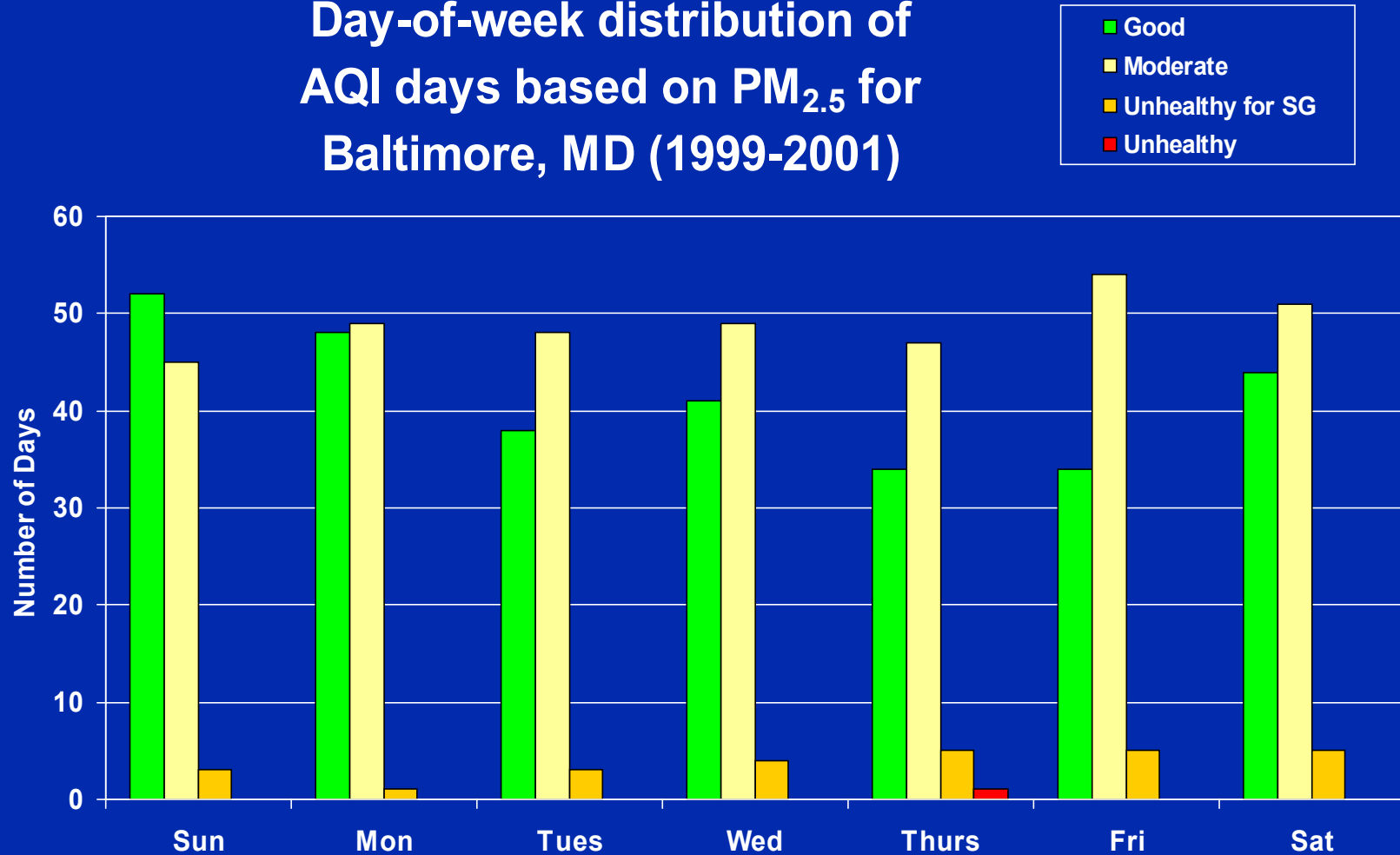
# Climatology – Example (1 of 2)

**Monthly distribution of AQI days  
based on PM<sub>2.5</sub> for Baltimore, MD (1999-2001)**



# Climatology – Example (2 of 2)

Day-of-week distribution of  
AQI days based on  $PM_{2.5}$  for  
Baltimore, MD (1999-2001)





# Climatology

## Strengths

- Easy to develop and update
- Helps guide the forecast

## Weaknesses

- Not a stand-alone method
- Does not provide pollutant concentrations

# Statistical – Examples

- Develop statistical relationship between historical air quality and meteorological data
- Several methods
  - Regression
  - Classification and Regression Trees (CART)

# Statistical – Example (1 of 3)

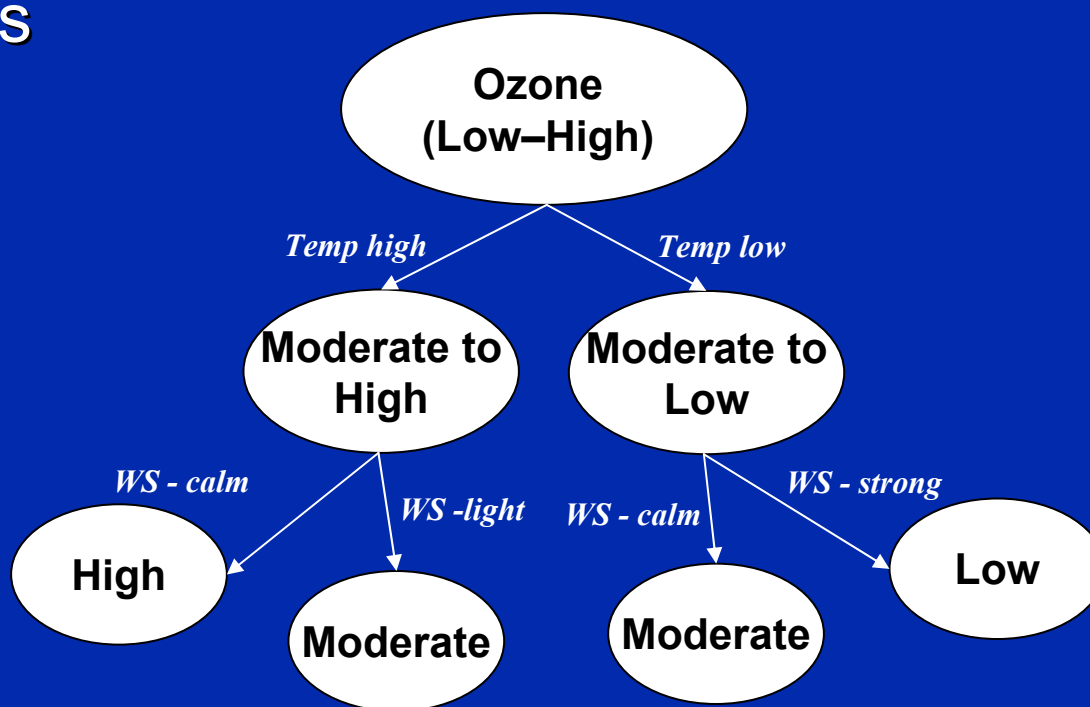
## PM<sub>2.5</sub> Regression Equation

$$\text{PM}_{2.5} (\mu\text{g}/\text{m}^3) = 53.429 + 3.382*\text{Holiday} - 0.189*\text{Precip} - 0.31*\text{Tmax} \\ - 0.541*\text{SurfaceWS} + 1.008*(\text{T@700mb} - \text{Tmin}) \\ + 0.838*(\text{Stability}) + 0.183*\text{Td@700mb00Z} - 0.292*\text{WS@850mb00Z}$$

Variable	Description
Holiday	1 for Valentine's Day, Martin Luther King, Jr. Day, Presidents' Day, Veterans' Day, and Super Bowl Sunday. 2 for Thanksgiving weekend and Christmas Eve through New Year's Day. 1 for weekends immediately preceding or following any of the above holidays. 0 for all other days.
Precip	Forecasted precipitation in inches during the 24-hr forecast period.
Tmax	Forecasted daytime maximum temperature (°F)
SurfaceWS	Average resultant wind speed from 12Z to 00Z (0500 to 1700 MST)
T@700mb	Temperature at 700 mb at 12Z (0500 MST) (°C)
Tmin	Forecasted or observed minimum temperature (°C)
Stability	Temperature at 700 mb at 00Z (1700 MST) (°C) minus the forecasted daytime maximum temperature (°C) at the surface
Td@700mb00Z	Dew-point temperature at 700 mb at 00Z (1700 MST) (°C)
WS@850mb00Z	Wind speed at 850 mb at 00Z (1700 MST) (m/s)

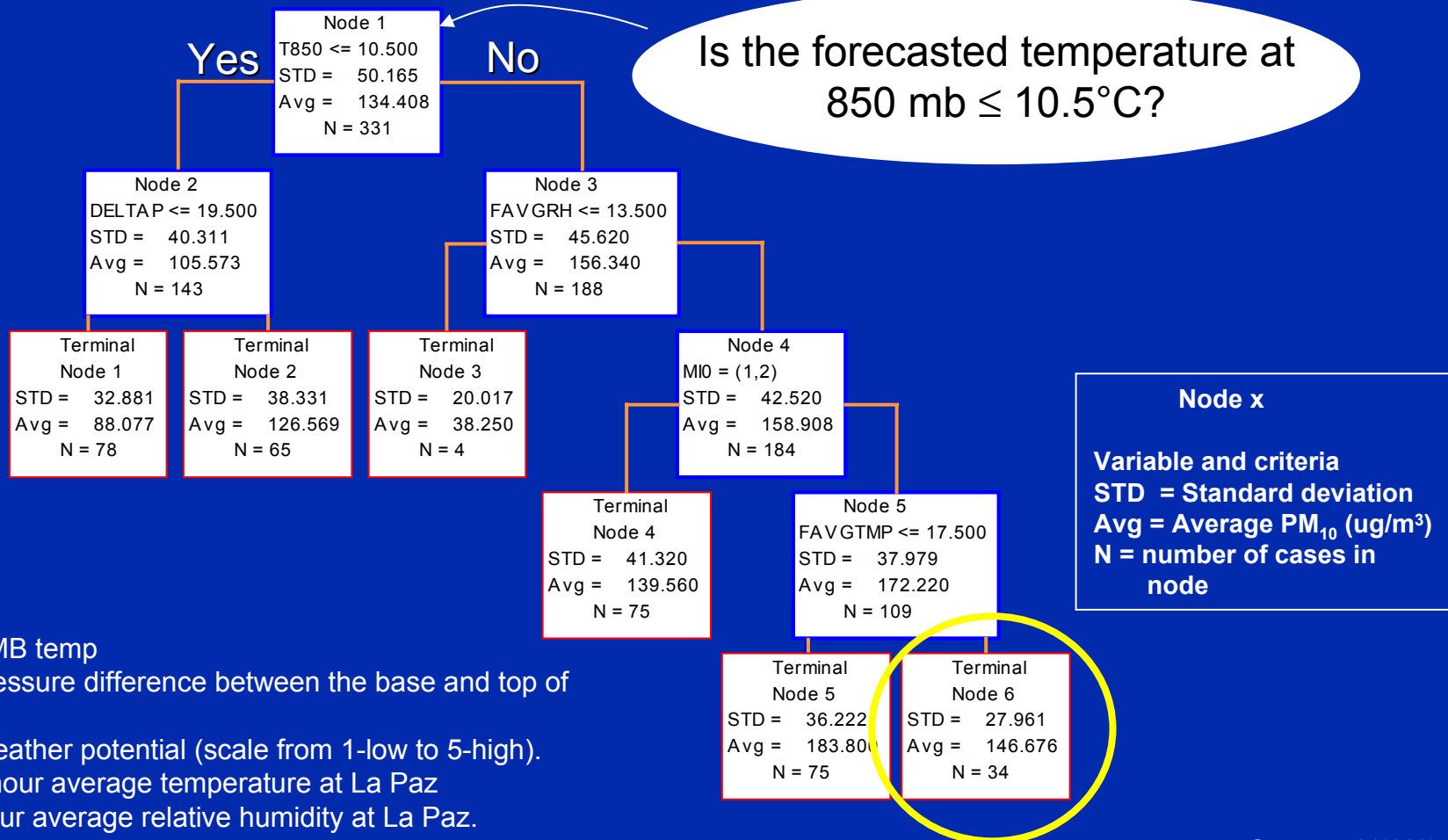
# Statistical – Example (2 of 3)

- Classification and Regression Trees (CART)
- Software develops the decision tree with human guidance
- CART splits data sets into similar and dissimilar groups



# Statistical – Example (3 of 3)

## CART classification $PM_{10}$ in Santiago, Chile



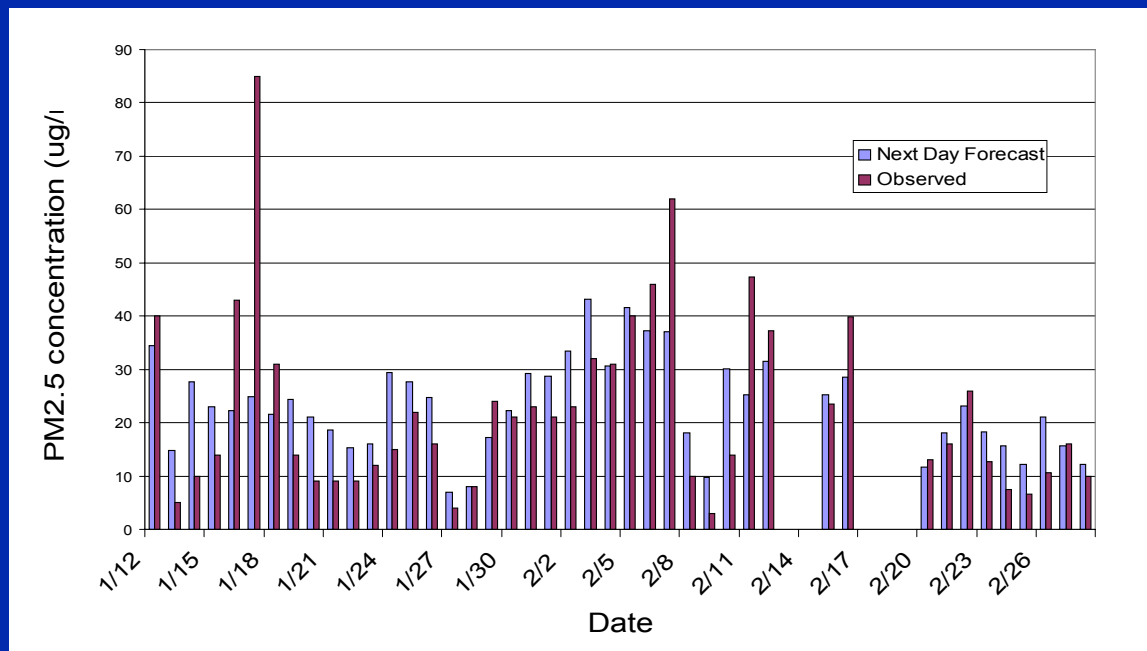
Cassmassi (1999)

# Statistical

Salt Lake City, UT  
Next Day PM<sub>2.5</sub> Forecast and Observed PM<sub>2.5</sub>

## Strengths

- Easy to operate
- Provides concentration or AQI category estimates

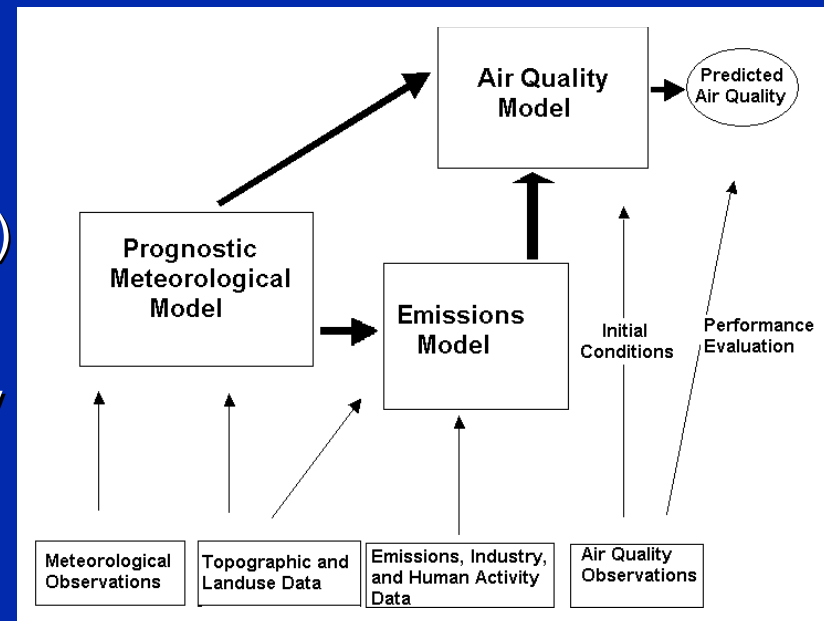
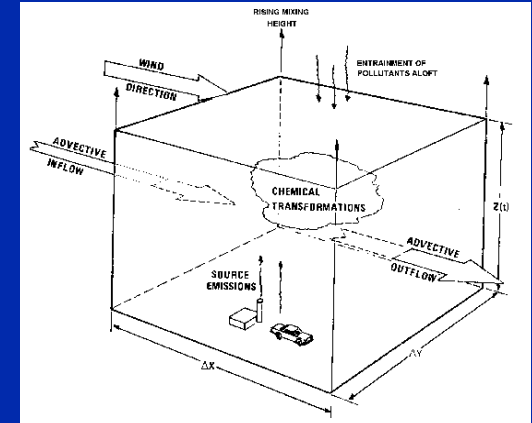


## Weaknesses

- Requires more expertise to develop
- Must be updated every three years or so
- Tends to underpredict peak concentrations

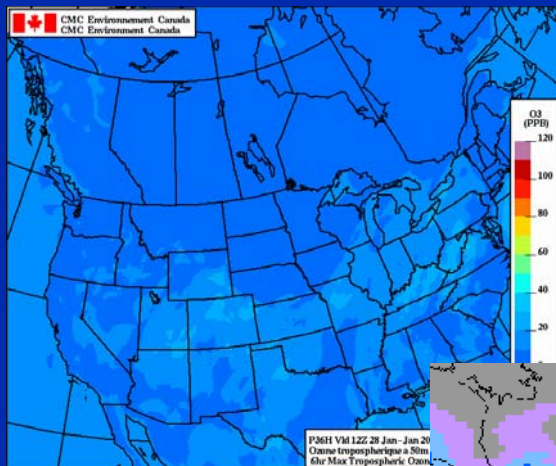
# Modeling

- Numerically model the processes
- Requirements:
  - Gridded emission model
  - Meteorological model forecasts
  - Photochemical model
  - Other supporting data
    - Land use
    - Boundary conditions (air quality)
  - Computer resources
- More sources of uncertainty

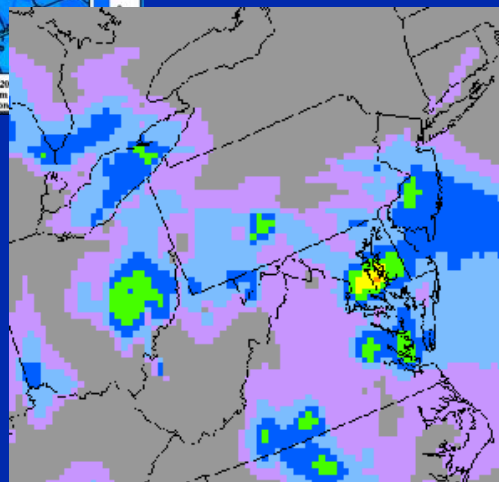


# Modeling – Example (1 of 2)

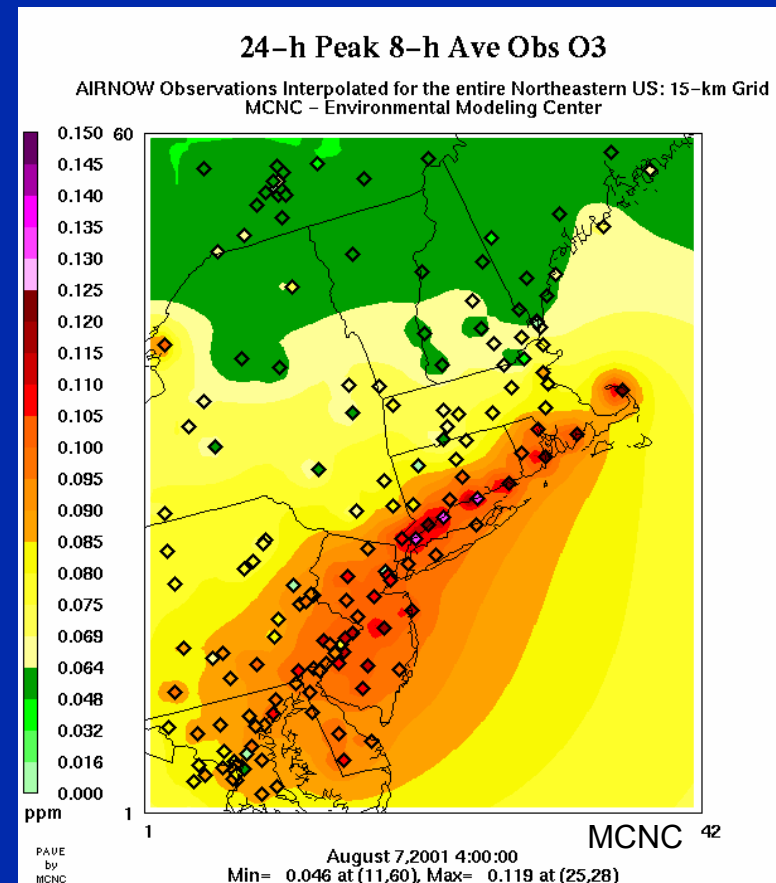
Research and operational modeling is being conducted by a number of organizations: Environment Canada, MCNC, NOAA, Ohio State, Sonoma Technology, Inc., SUNY-Albany, Washington University



Environment Canada



SUNY-Albany

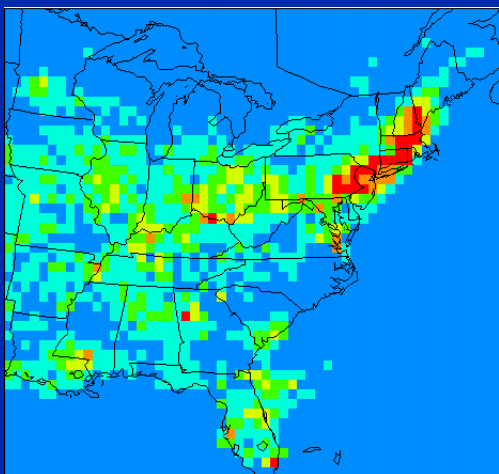




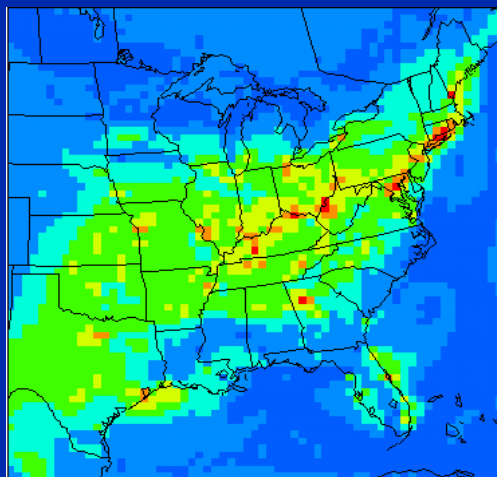
# Modeling – Example (2 of 2)

Ozone concentration forecasts and observations on August 5, 2002, at 0400 EDT

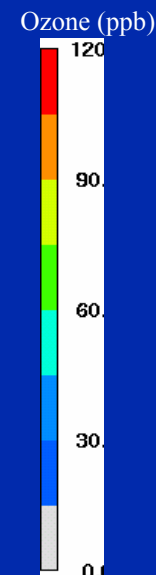
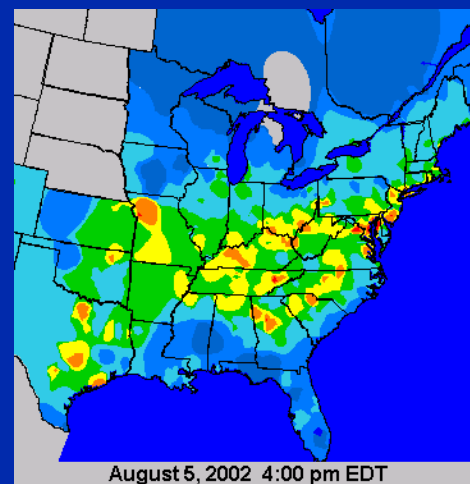
NOAA ARL's HYSPLIT



MCNC's MAQSIP



AIRNow Data



# Modeling

## Strengths

- Based on atmospheric and chemistry physics
- Provides forecasts in areas without monitors
- Helps further explain air quality processes
- Provides better temporal resolution than other methods

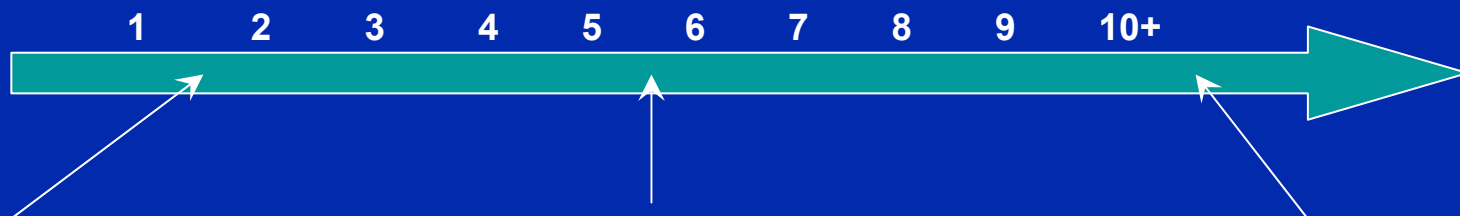
## Weaknesses

- High level of expertise and funding needed to develop, operate, and improve\*
- Requires substantial computer resources

\* NOAA is planning to run a model and provide forecast guidance to air quality forecasters.

# Evolution of Forecasting Programs

Age of Forecasting Program (years)



- Limited data
- Limited experience and understanding
- One forecasting tool/technique
- Modest accuracy

- Good historical data set
- Good understanding
- Modest experience
- Several forecasting tools/techniques
- Higher accuracy

- Excellent historical data set
- Detailed understanding
- Extensive experience
- Many forecasting tools/techniques
- Highest accuracy

# Summary

## Air Quality Forecasting Tools

- Data availability and quality
- Develop understanding
- Develop tools
- The more tools the better

- Next step - Lunch
- Questions